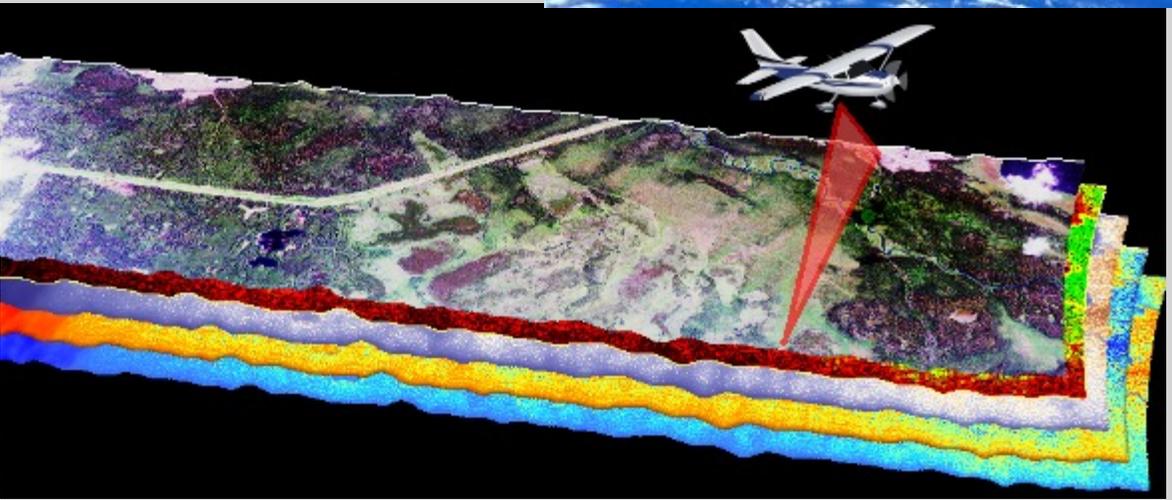




Spectral Imaging Working Group

Co-Chairs: Peter Nelson, Fred Huemmrich

~ 82 members





We have identified some areas of interest

- Scaling - addressing scaling from ground to drones to aircraft to satellite, involving processing and analysis techniques and data synthesis.
- Relating spectral reflectance characteristics to vegetation traits and processes
- Solar Induced Fluorescence (SIF) studies - addressing the measurement and use of solar induced fluorescence and its relationship to biophysical processes.

Recently published study:

JGR Biogeosciences

RESEARCH ARTICLE

10.1029/2021JG006697

Special Section:

The Earth in living color: spectroscopic and thermal imaging of the Earth: NASA's Decadal Survey Surface Biology and Geology Designated Observable

Remote Sensing of Tundra Ecosystems Using High Spectral Resolution Reflectance: Opportunities and Challenges



Peter R. Nelson¹ , Andrew J. Maguire² , Zoe Pierrat³ , Erica L. Orcutt⁴ , Dedi Yang⁵ , Shawn Serbin⁵ , Gerald V. Frost⁶ , Matthew J. Macander⁶ , Troy S. Magney⁴ , David R. Thompson² , Jonathan A. Wang⁷ , Steven F. Oberbauer⁸, Sergio Vargas Zesati⁹ , Scott J. Davidson^{10,11} , Howard E. Epstein¹² , Steven Unger⁸, Petya K. E. Campbell¹³ , Nimrod Carmon², Miguel Velez-Reyes⁹ , and K. Fred Huemmrich¹³

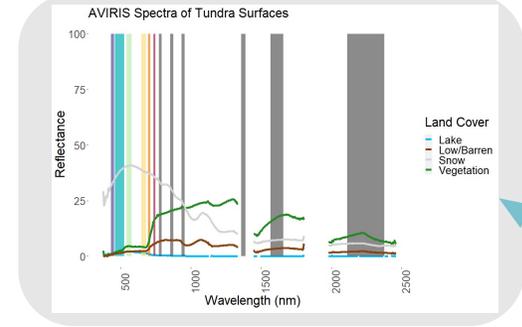
Key points:

Imaging spectroscopy (IS) can help to measure critical Arctic tundra properties, physiological function, and temporal dynamics

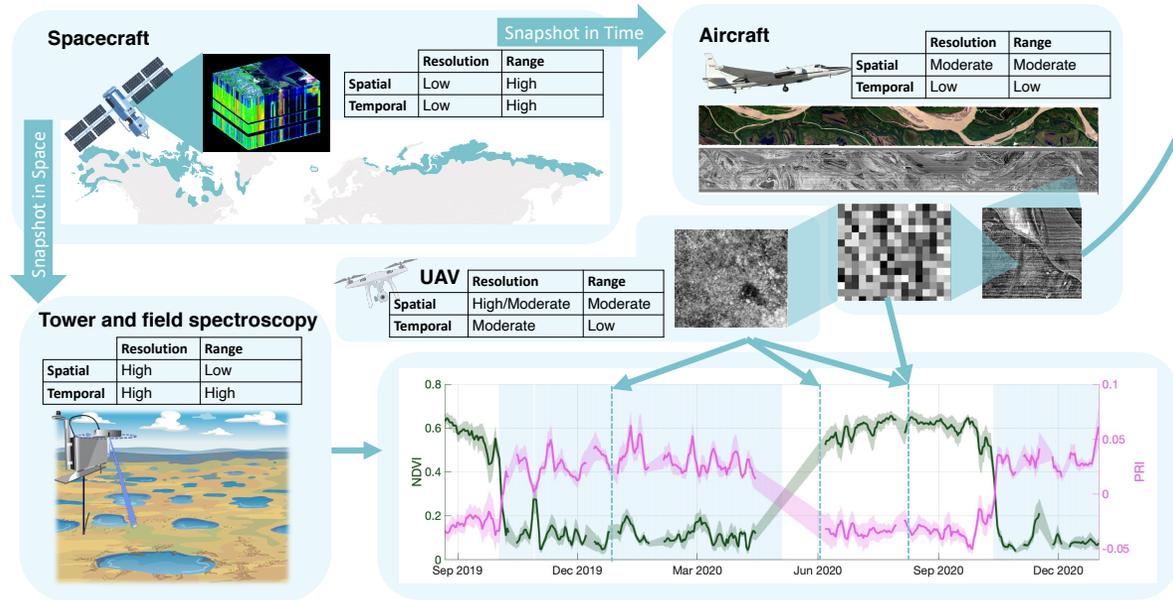
To properly interpret IS data users must consider spectral complexity of tundra driven by composition, sensitivity to climate, and phenology

Unique Characteristics of Tundra (Sections 2-3)

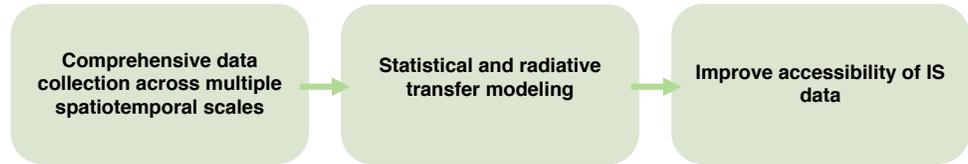
- High variability across and within species
- Mixed pixels
- Highly dynamic photoperiod
- High prevalence of snow and clouds
- High degree of dimensionality



Spectroscopy for Tundra Studies Through Time and Space (Section 4, Table 2)



Recommendations and a Pathway Forward (Section 5)

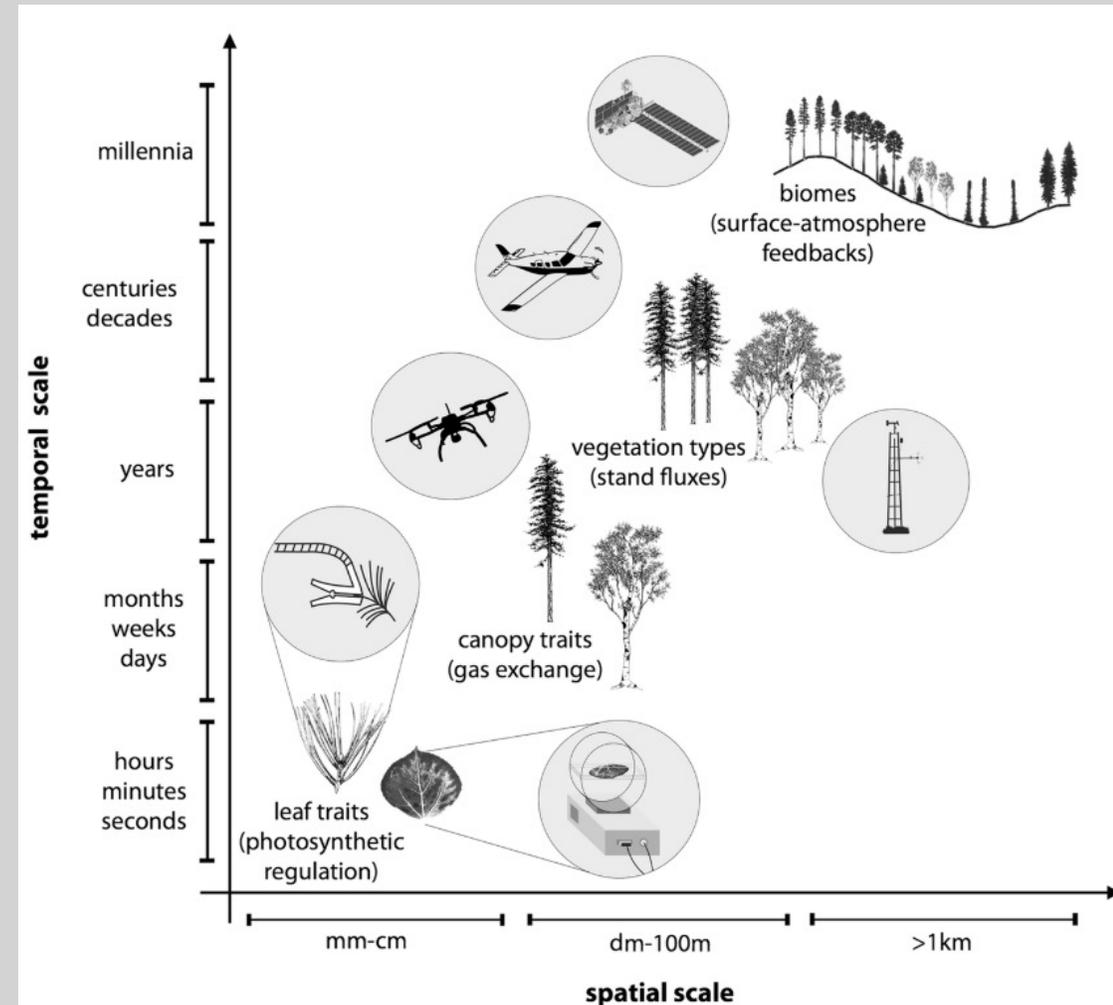




Next SIWG Synthesis Effort

We are discussing synthesis studies on scaling in optical remote sensing for high latitudes leading to another group paper

- 1) Spatial scaling
Do different types of landscapes have different spatial breakpoints in reflectance?
- 2) Temporal scaling
How to resolve short term responses, seasonal responses, disturbances, and multiyear green/browning trends?
- 3) Spectral scaling
What spectral resolution is required for different types of retrievals?
- 4) What are the cross-component scale dependencies?



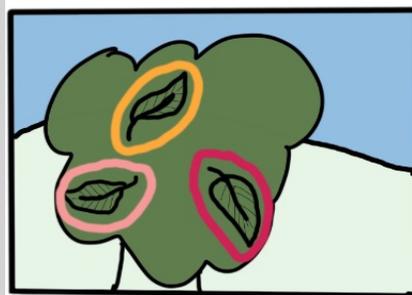
Gamon et al., 2019

We have been having monthly meetings, all are welcome

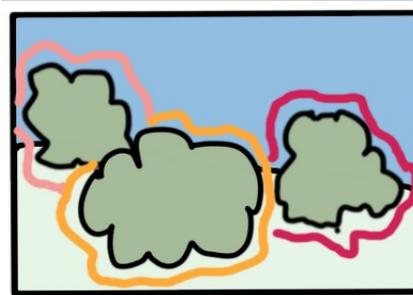
Consider four levels of organization (leaf, individual, species, community)

- What is the variation between levels across wavelengths and time during the growing season?

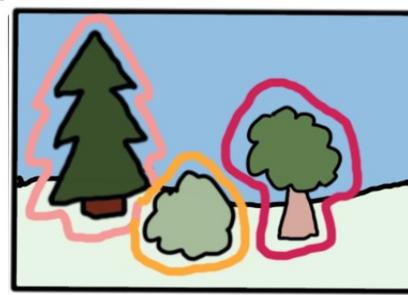
intra-individual



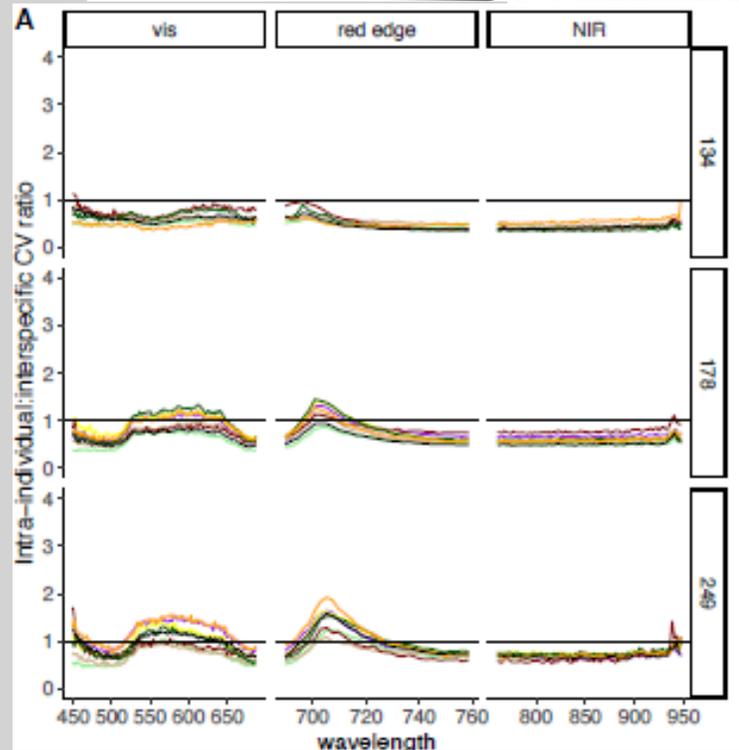
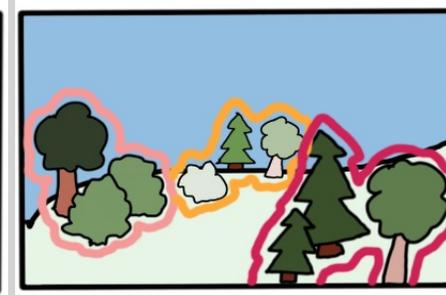
intraspecific



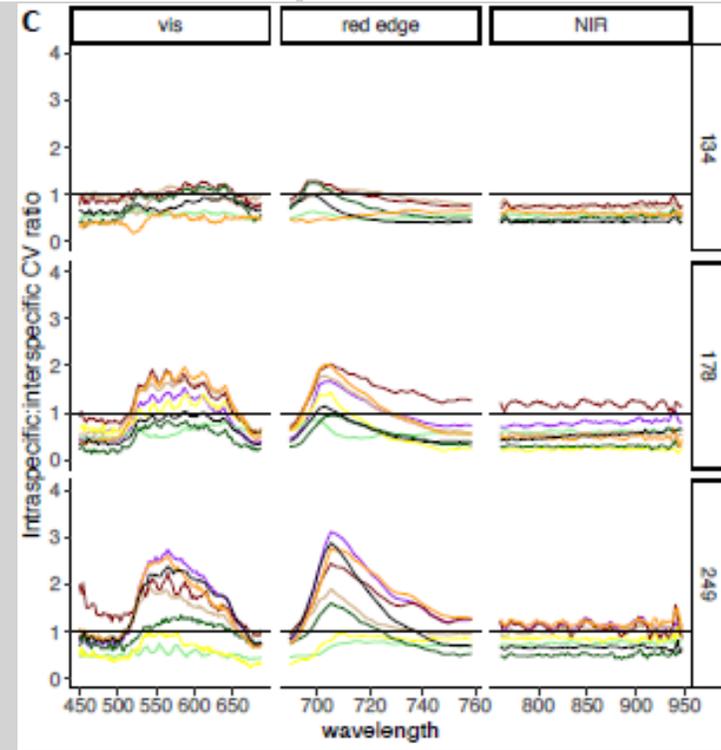
interspecific



inter-community



Leaf-to-leaf variability (CV) relative to inter-specific variability by wavelength (left to right) and Julian date (top to bottom)

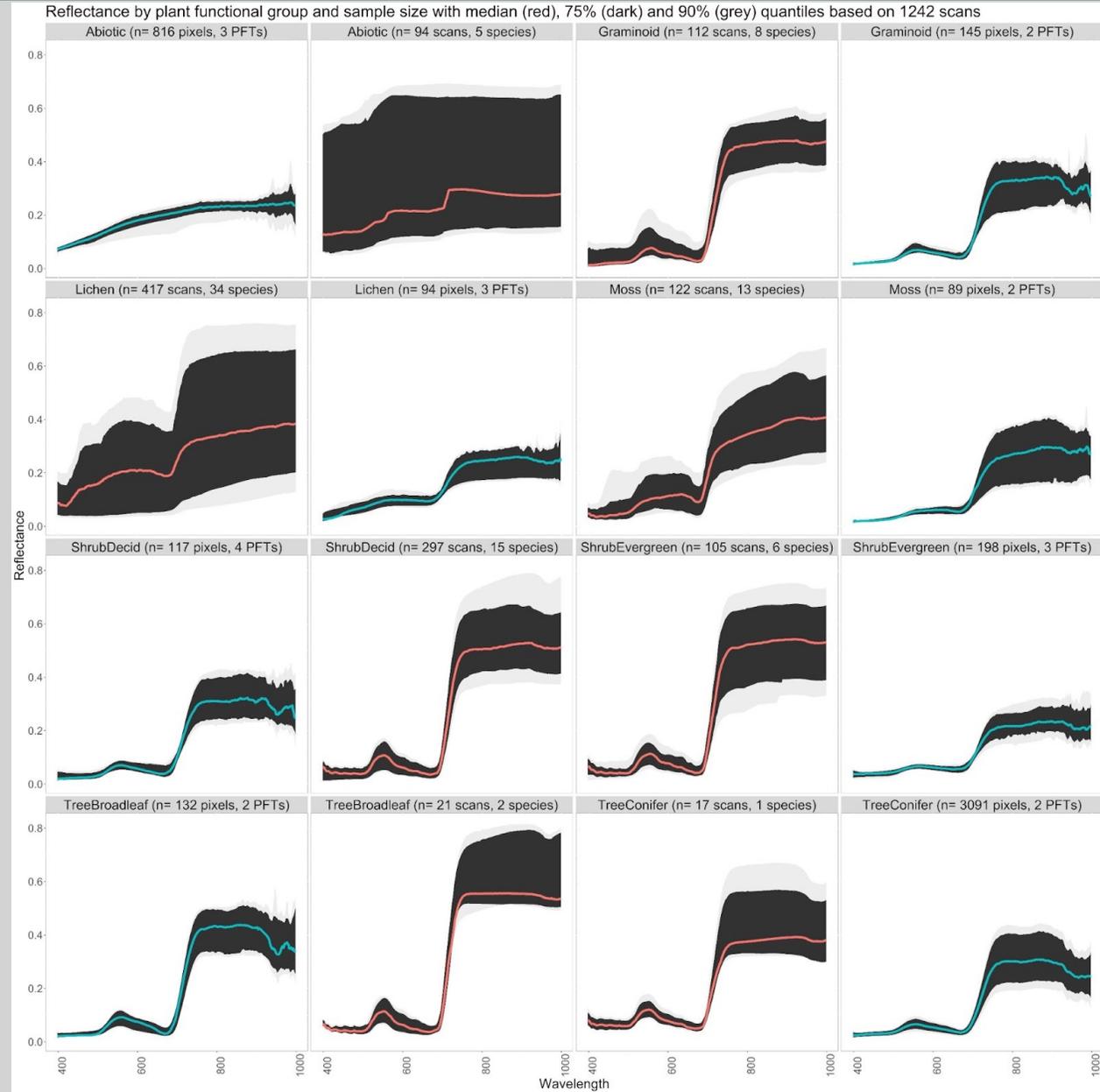
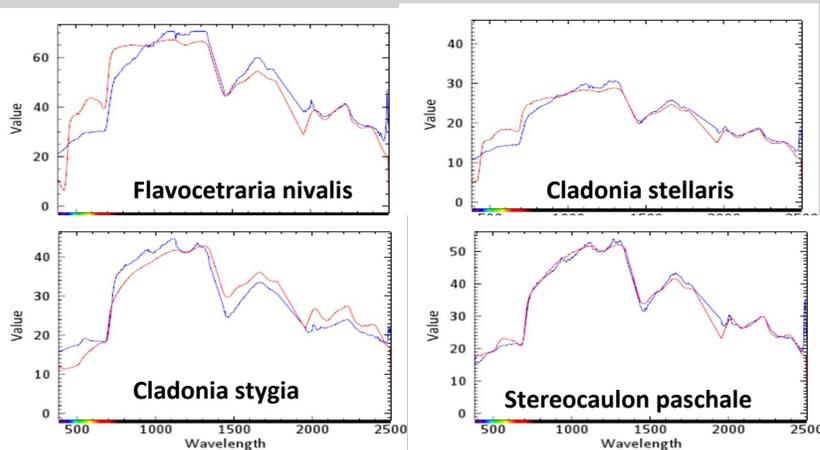


Individual-to-individual variability relative to inter-specific variability by wavelength (left to right) and Julian date (top to bottom)

Spectral scaling between ground and airborne spectrometers

Peter R. Nelson, Kenneth Bundy, Matt Macander - Biome Shift - PI Goetz Phase 3

- Ground reflectance measurements (red line below) at the leaf-level for PFTs shows agreement in pure AVIRIS pixels (blue line - below for select lichen end member)
- Pure patches of each PFT were digitized in the UAV VNIR images, which also show agreement to ground spectra
- Ground (red)/image(blue) reflectance comparison by PFT shows similar shape but differing magnitudes and variability
- How best to deal with cross-instrument data use?



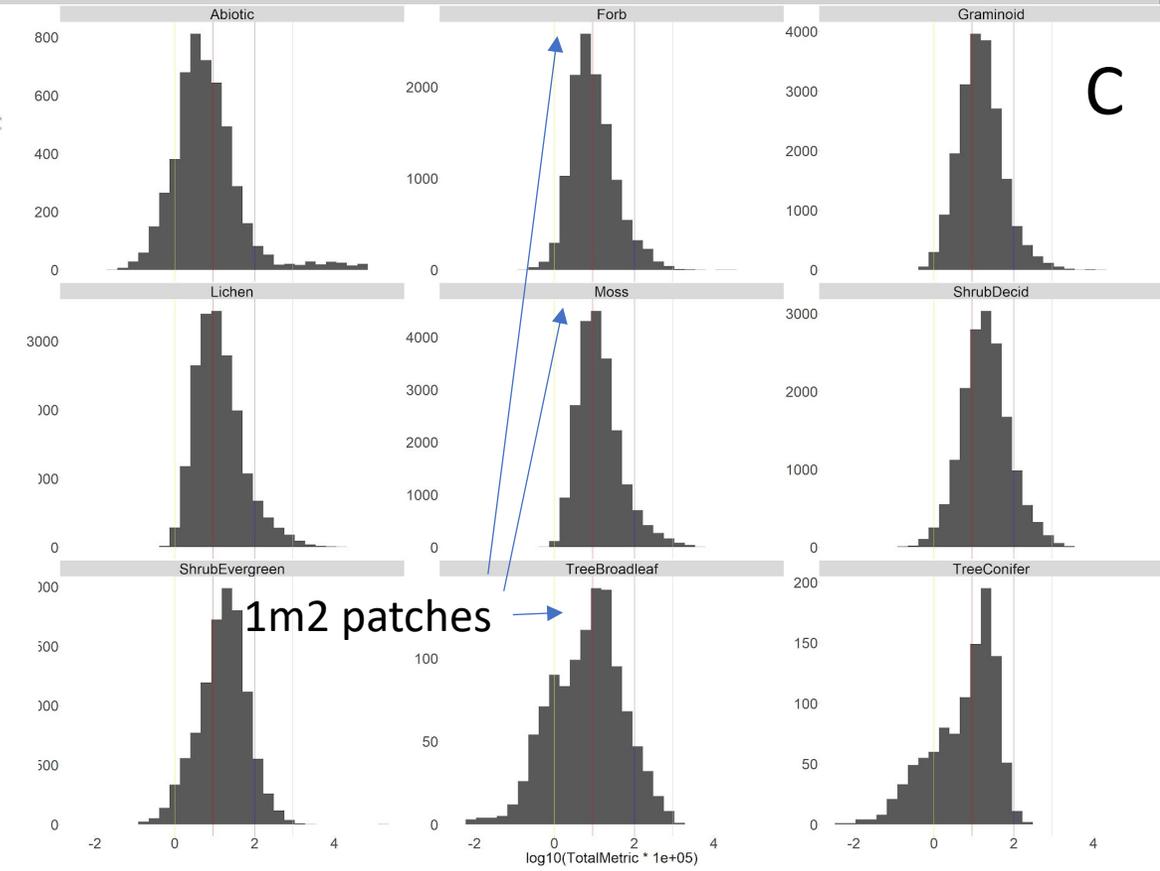
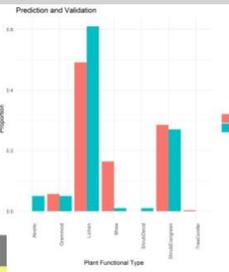
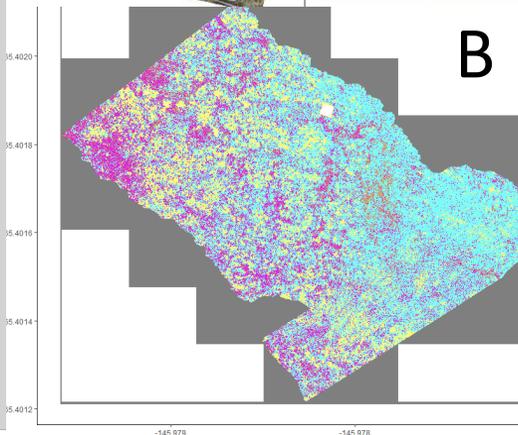
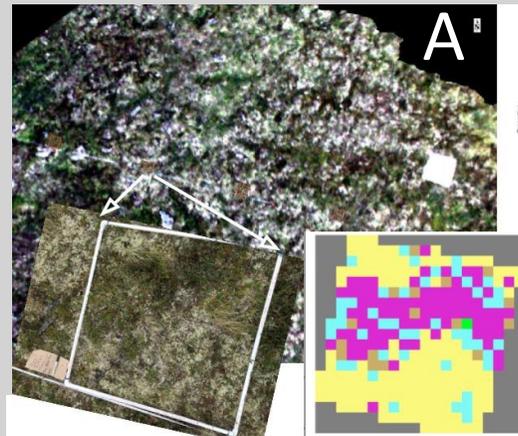
Patch sizes of plant functional types from UAV-based VNIR spectrometer data indicate much of the area occurs in patches too small to be resolved in airborne and space-based imagery

Peter R. Nelson, Kenneth Bundy, Matt Macander
 - Biome Shift - PI Goetz Phase 3

1) Ground based spectra modeled PFT occurrence in UAV VNIR images (Panel A) compared to human estimates of PFT cover

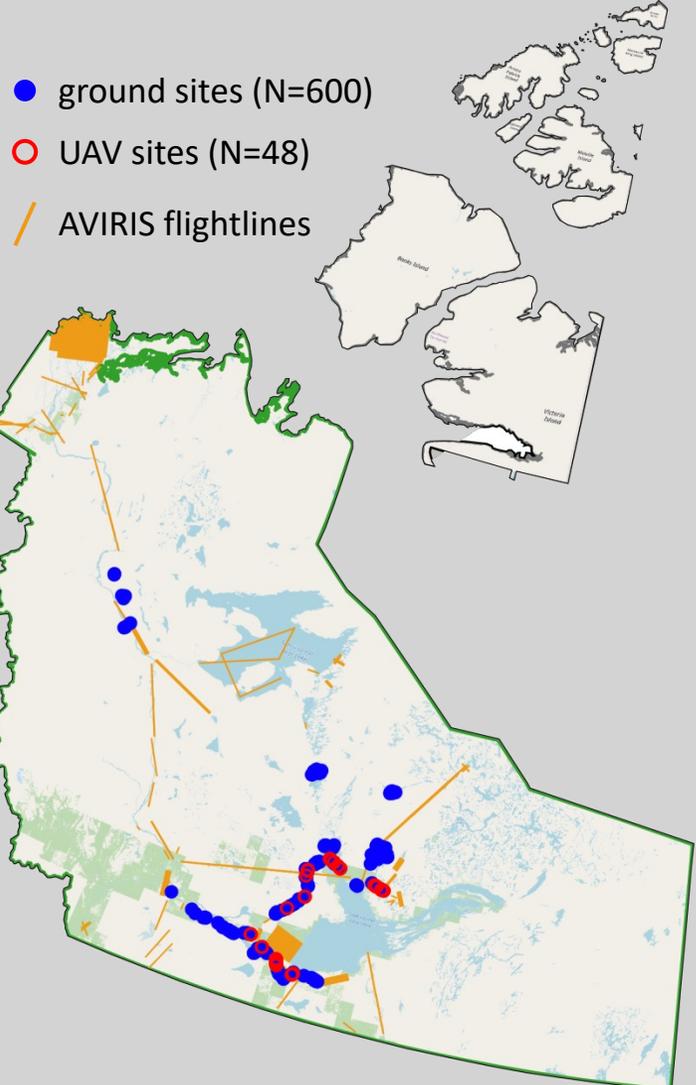
2) PFT maps made for 77 VNIR images in ABoVE domain mostly under AVIRIS (Panel B).

3) Patch size total area distributions (Panel C) of many PFTs from those 77 images mostly fall well below spatial resolution of airborne and space based products (0 on X axis = 1m2 patch = yellow line)



Stacked ground-UAV-AVIRIS data set for lichen mapping in NWT, Canada

Maria Belke-Brea, J. van der Sluijs, R. Fraser, G. Degré-Timmons, S. Cumming, J. Baltzer



Upscaling to AVIRIS for lichen mapping

Classification of UAV data (random forest algorithm)

UAV training data set for 13 veg. and ground classes

UAV data collection at sites overflowed by AVIRIS

Ground truthing: All UAV sites have in situ veg. data

Done To do

⊙ Upscaling questions:

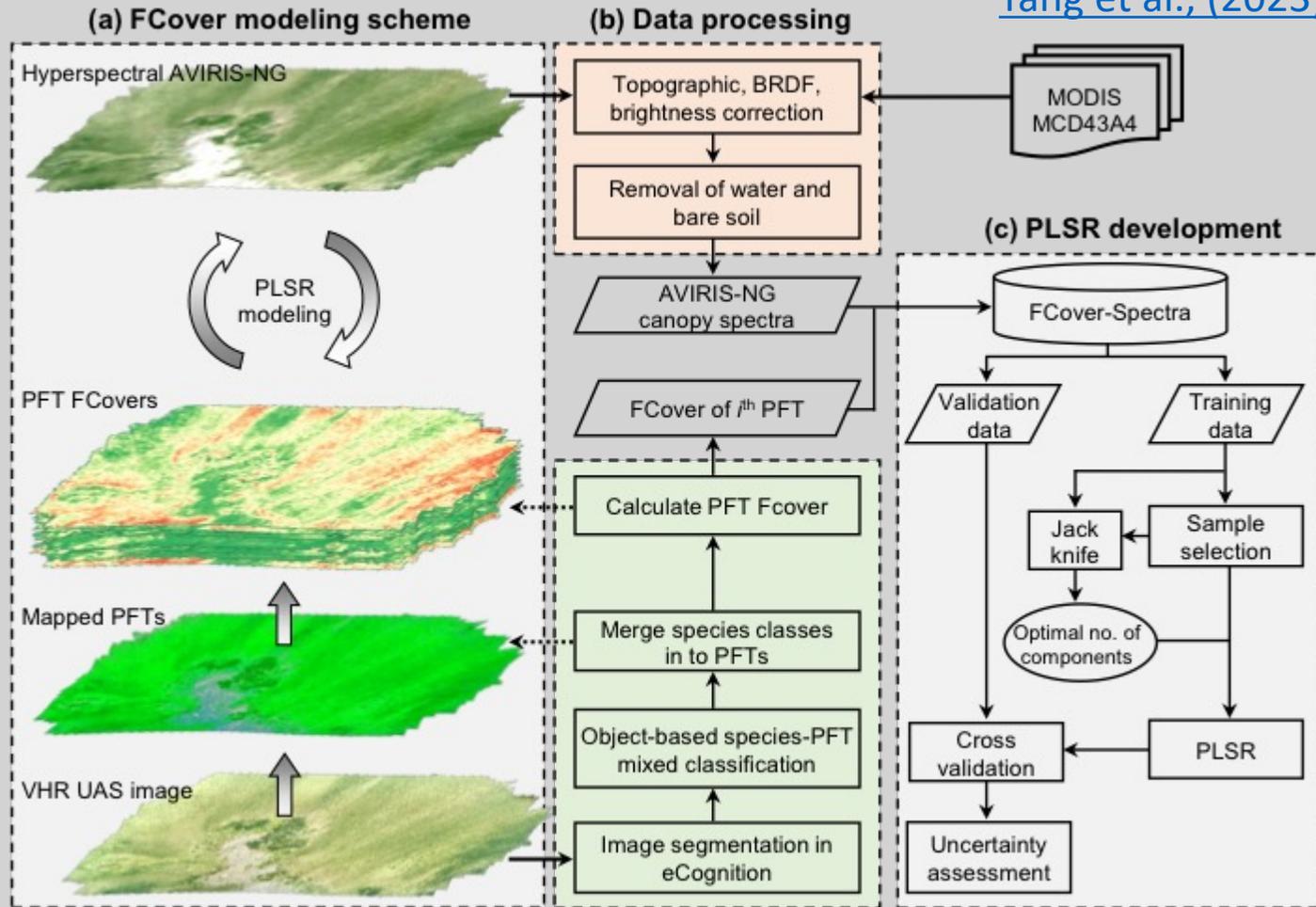
1. What is the threshold of lichen detectability in AVIRIS data?
2. How well does high spectral resolution compensate for lower spatial resolution?

🚁 RGB-UAV data specs:

- 19600 m² mapped area per mission
- Spatial resolution: ~ 1 cm
- ~30 000 overlapping pixels with AVIRIS

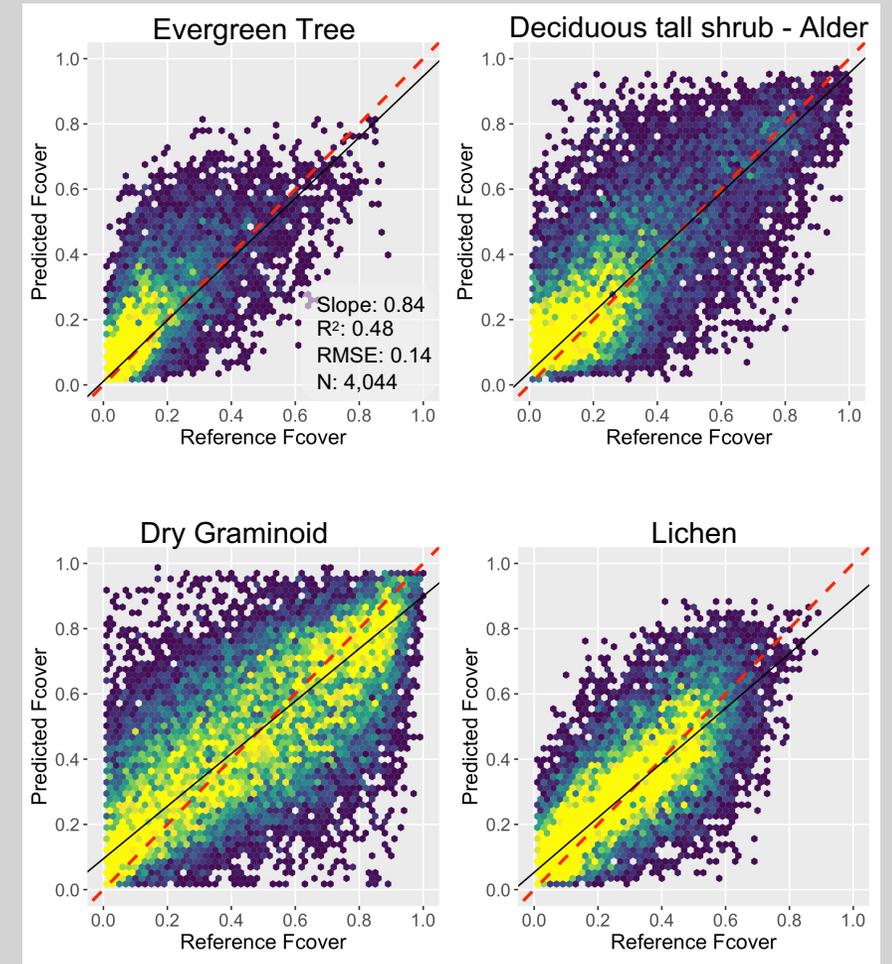
High-resolution UASs allow researchers to map and upscale plant functional type composition at unprecedented details.

[Yang et al., \(2023\)](#)

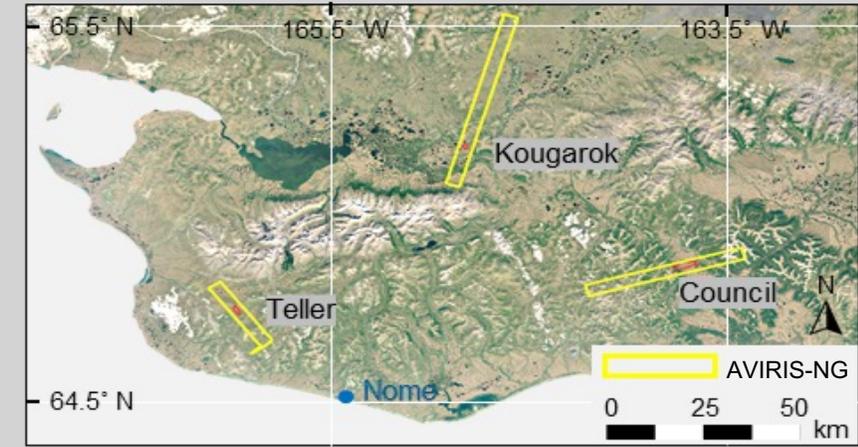
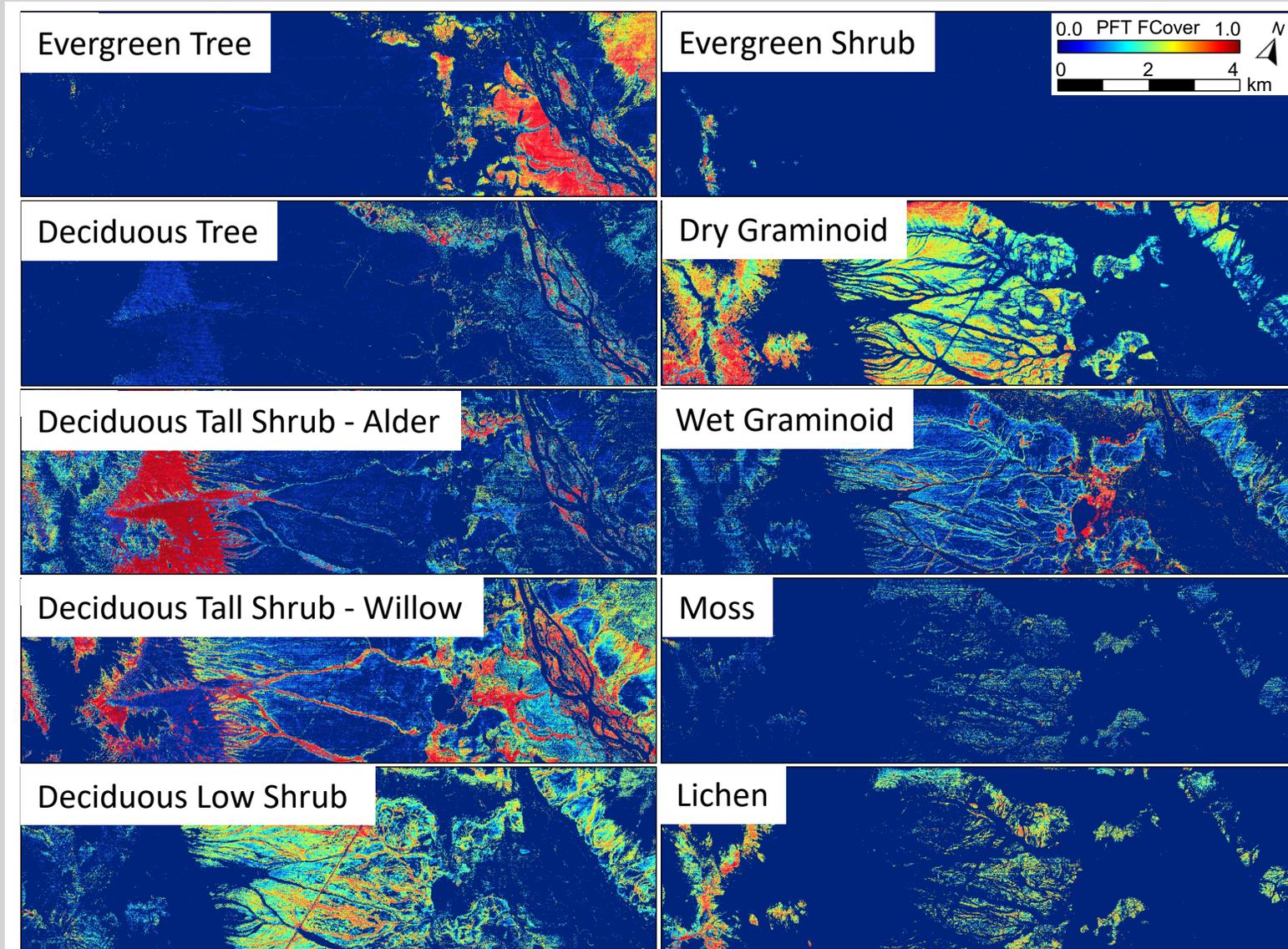


Shawn Serbin & Daryl Yang

Examples of PFT fractional cover validation results against maps derived from high-resolution UAS data



Example results from Council, Seward Peninsula

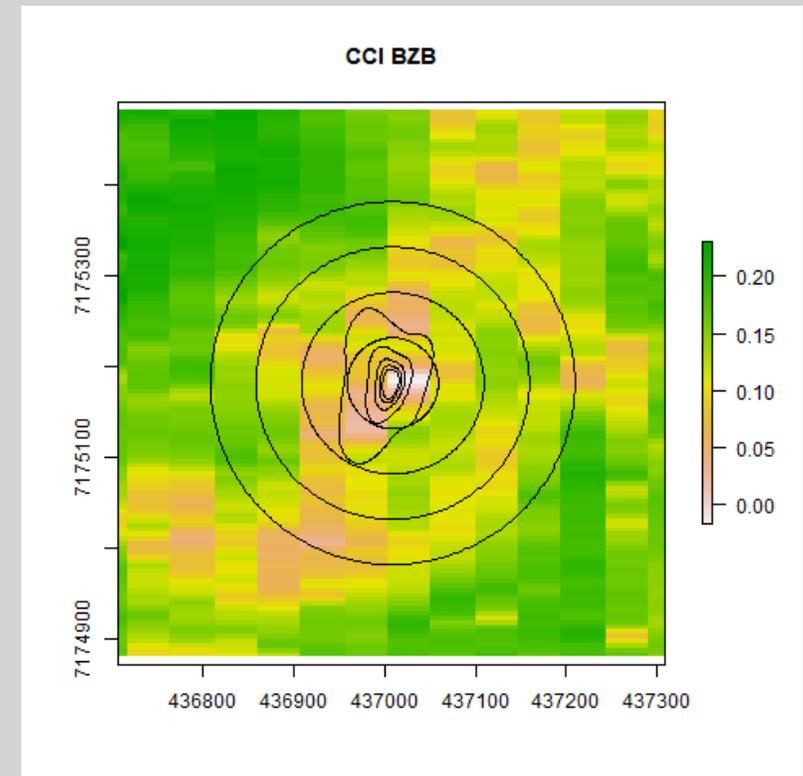
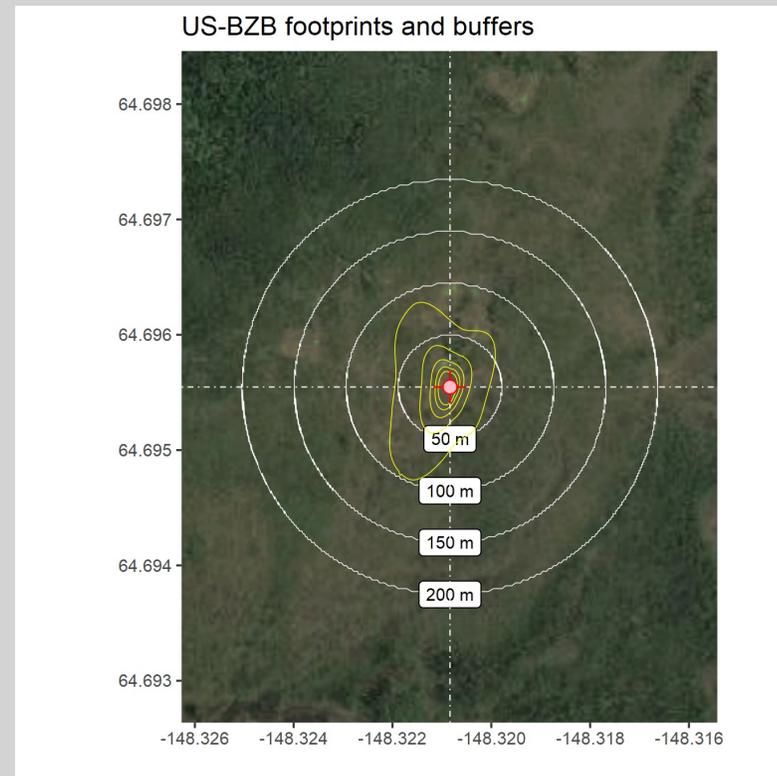


Findings:

- The fractional cover of 12 Arctic PFTs are accurately captured with the UAS-based upscaling.
- The developed scaling method is highly capable of differentiating the composition of spectrally similar PFTs, e.g., Alder, Willow, and Poplar trees.
- UAS-based upscaling is superior to traditional spectral mixing-based mapping of vegetation composition

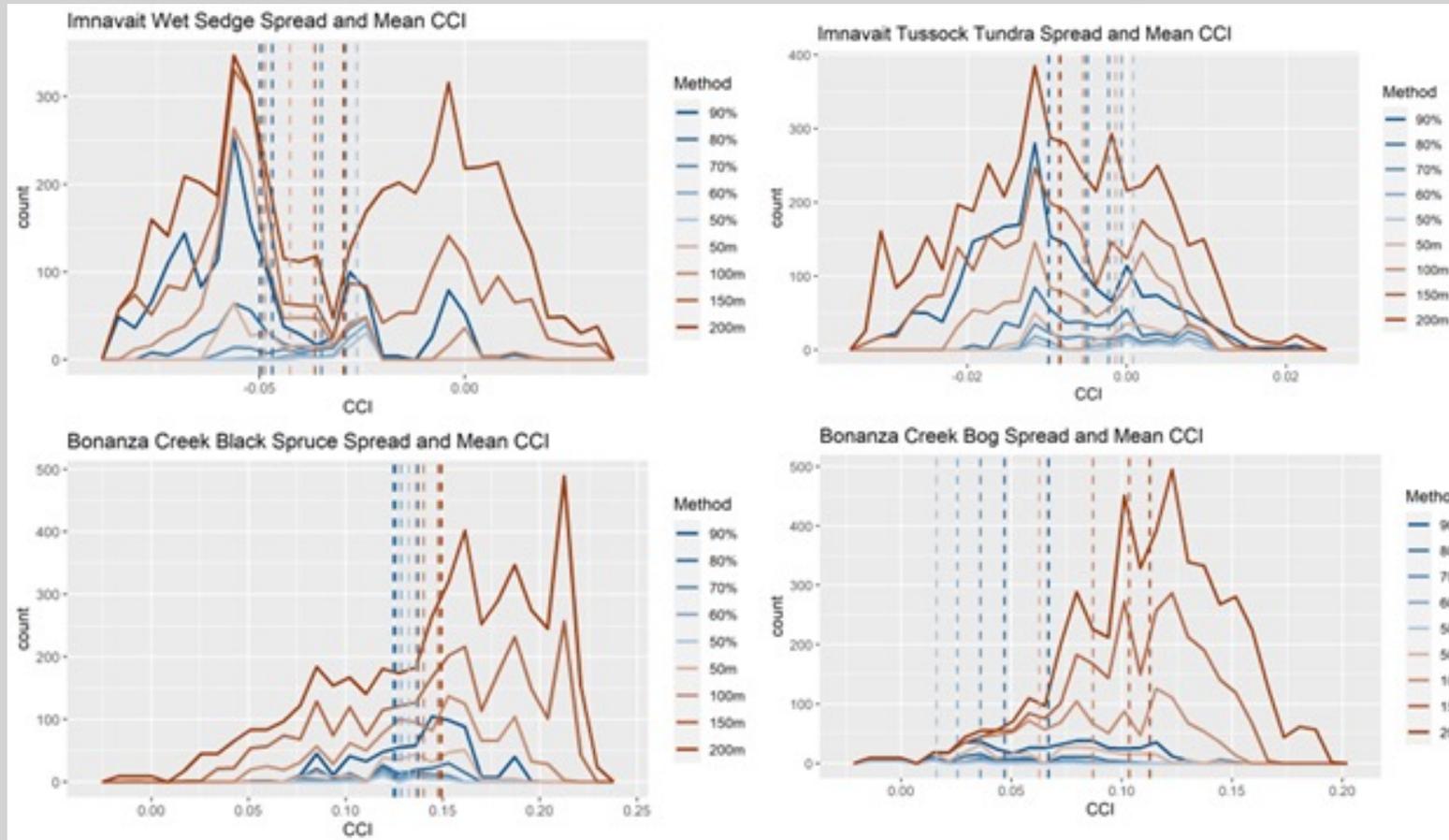
Assessing the variability of aircraft remote sensing products (CFIS and AVIRIS-NG) within flux tower footprints

- Question: What is the hyperspectral variability around flux towers at 14 sites within ABoVE domain?
- Looked at both radii contours (50-200m) and weighted averages of flux tower footprints

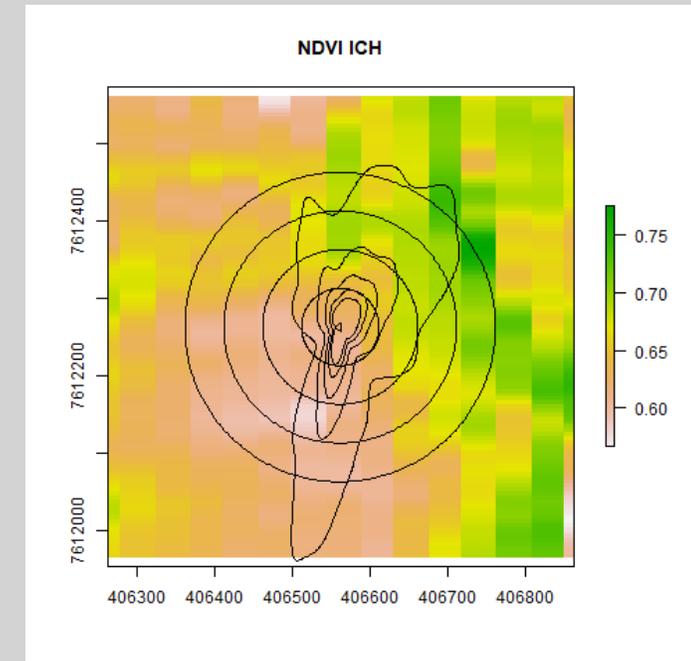


Erica L. Orcutt*, Christian Frankenberg, Housen Chu, Kyle A. Arndt, Eugenie S. Euskirchen, Gabriel Hould Gosselin, Manuel Helbig, Hiroki Ikawa, Hideki Kobayashi, Andrew J. Maguire, Philip Marsh, Gesa Meyer, Walter C. Oechel, Ryan Pavlick, William L. Quinton, Adrian V. Rocha, Christopher Schulze, Oliver Sonnentag, Donatella Zona, & Troy S. Magney

An example from 4 sites shows pixel counts using different footprints. Take home: How you compare flux tower data to remote sensing data matters. Recommend using weighted footprints.



% contour or radii distance from tower

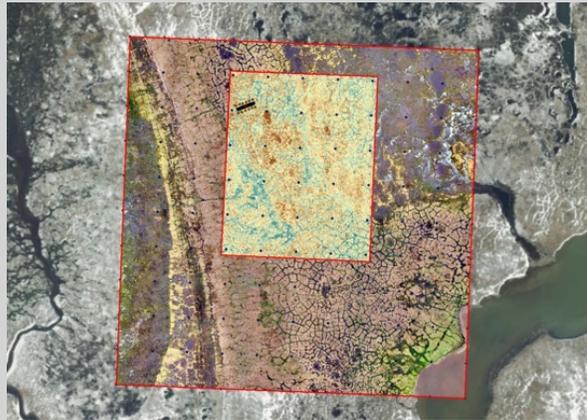


Scaling Tundra NDVI Green-up from Plot to MODIS

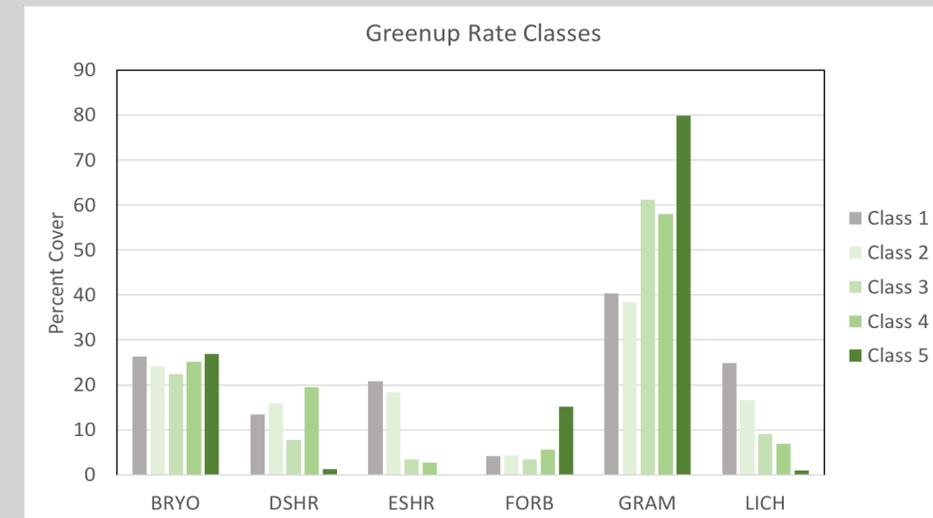
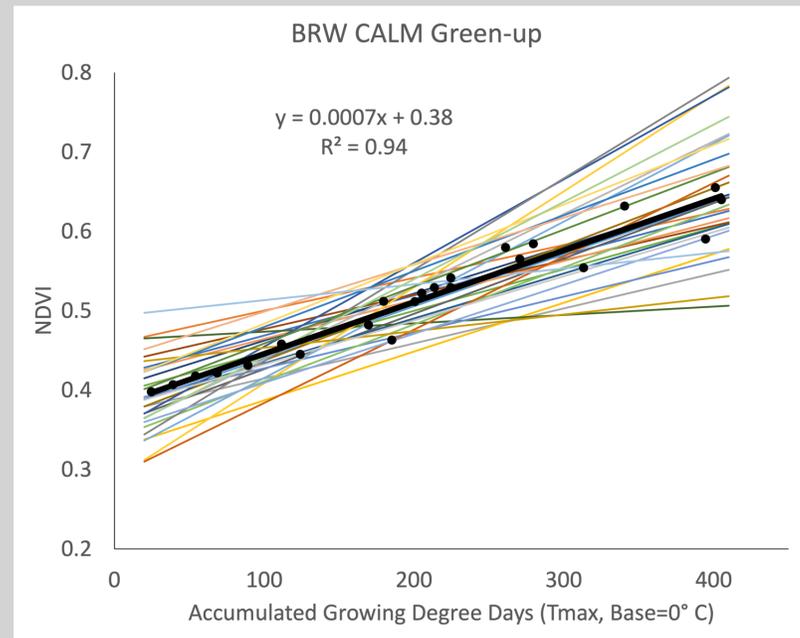
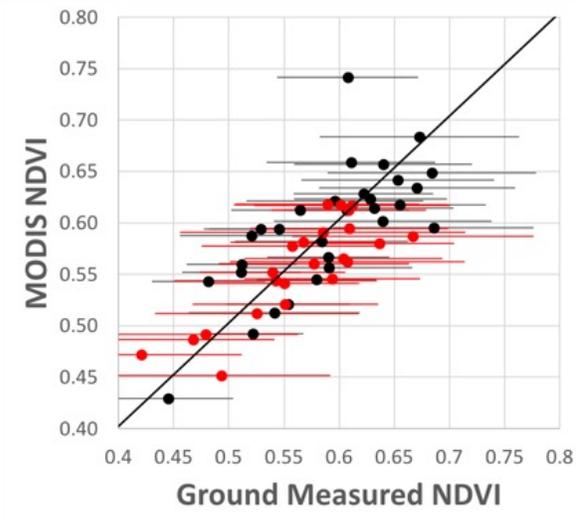
K.F. Huemmrich (UMBC), P. Campbell (UMBC), S. Vargas (UTEP), C. Tweedie (UTEP), R. Hollister (GVSU)

MODIS and ground measured NDVI for a subset of Circumpolar Active Layer Monitoring (CALM) grid

- Ground sampling of 30 points (~1 m² plots, 5x6 grid, 100 m between points), collected over 10 years



Average ground NDVI matches MODIS NDVI
Within pixel variability in springtime greening response to warmth
(accumulated Growing Degree Days) related to cover type



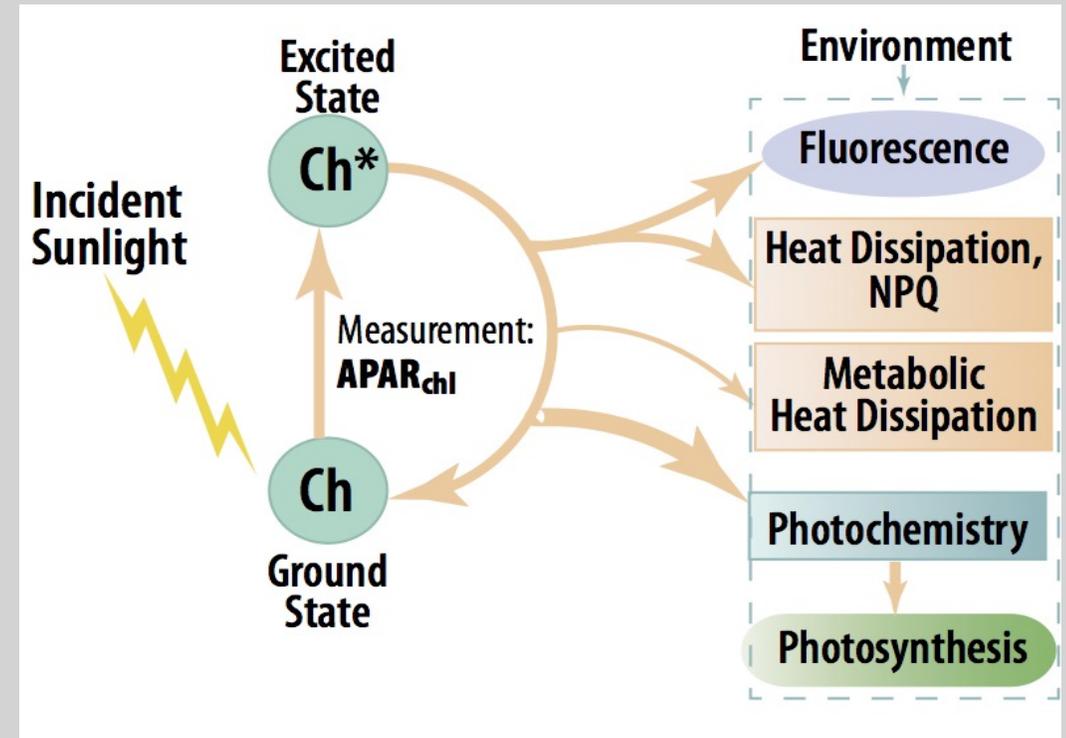
This work is supported by NASA (grant # NNX17AC58A)
We thank the Inupiaq communities whose land we are studying

Solar Induced Fluorescence (SIF) in ABoVE

Chlorophyll fluorescence (F) at leaf level is closely linked to photosynthesis.

Canopy solar induced fluorescence (SIF) can be remotely sensed and has the potential to link to the leaf-level processes and estimate productivity at different temporal and spatial scales.

Within ABoVE investigators are examining SIF at a range of spatial and temporal scales.

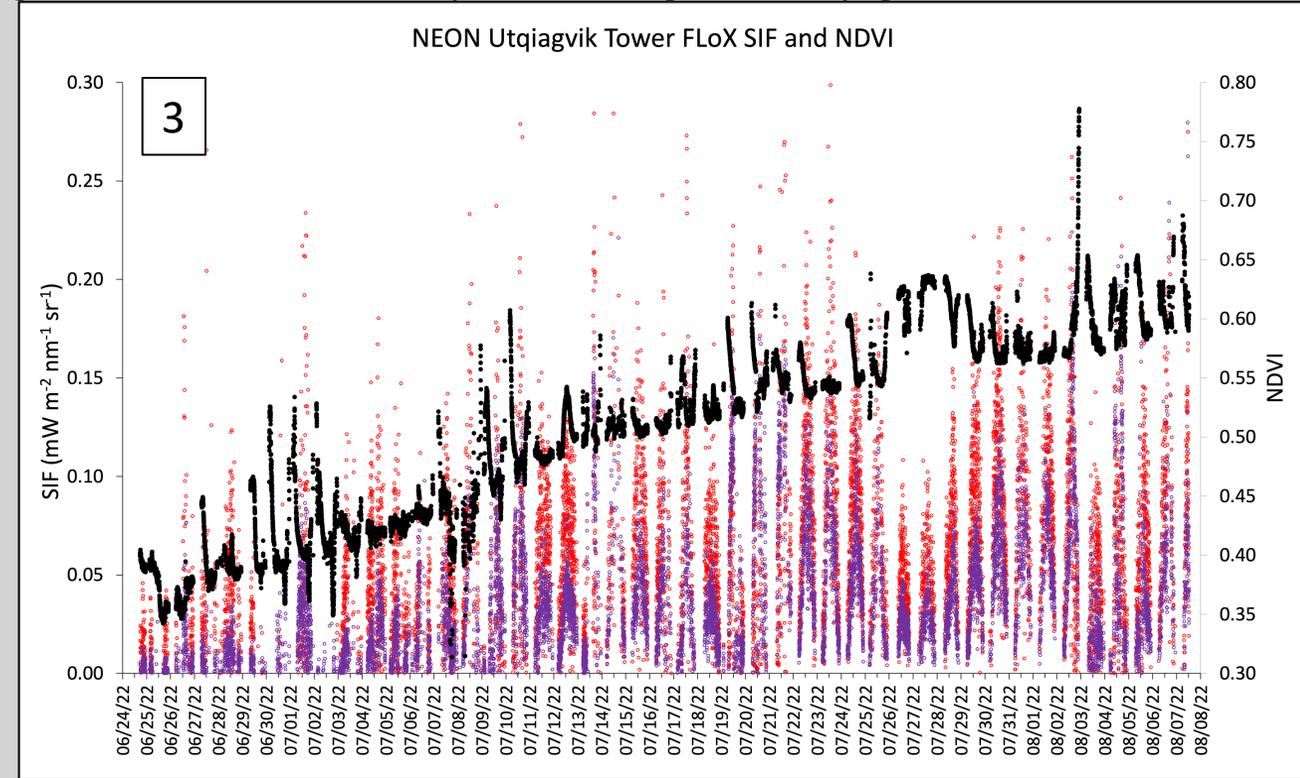
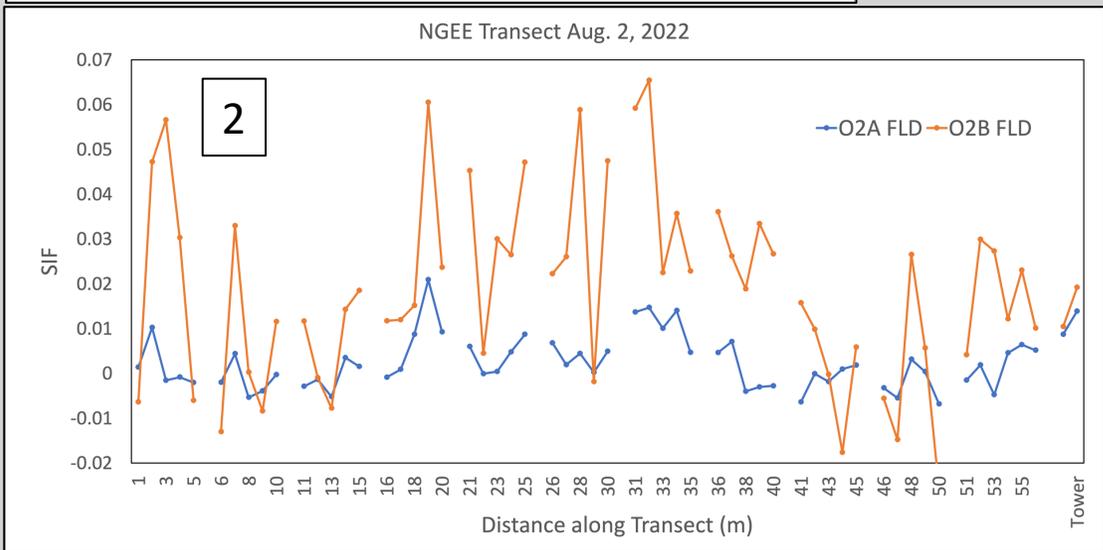
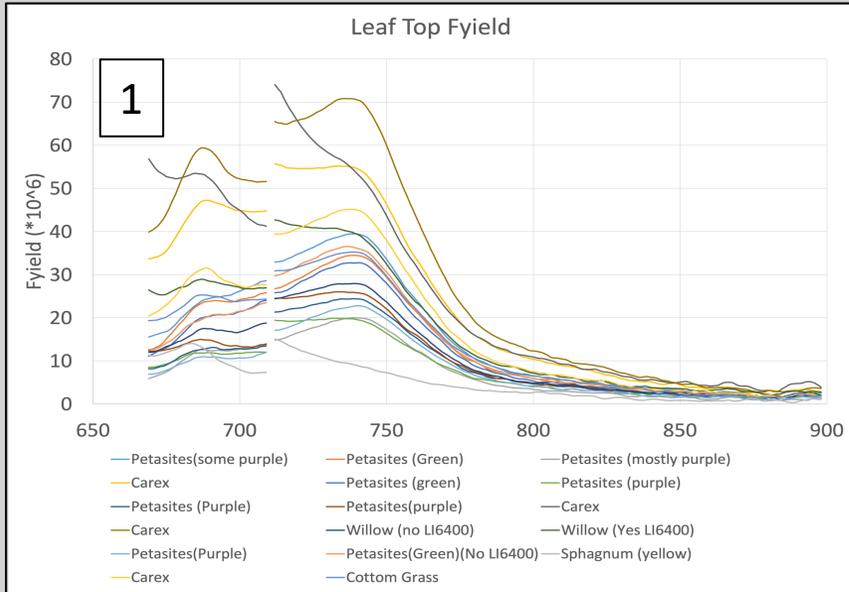


Field Measurements of Tundra Solar Induced Fluorescence (SIF)

K.F. Huemmrich, P. Campbell, S.A. Vargas Z., C. Tweedie, M. Mora, B. Almanza

Field measurements of tundra in Utqiagvik show important scaling factors for SIF

- 1) At the leaf level, both between and within species variation in magnitude of red and far red Fyfield peaks
- 2) Large spatial variability at the meter scale along transect from flux tower
- 3) Over time, significant diurnal variability even during 24 hr. daylight



This work is supported by NASA grant 80NSSC19M0110. We are grateful to the Inupiaq communities whose land we are studying

JGR Biogeosciences

RESEARCH ARTICLE
 10.1029/2021JG006588

Diurnal and Seasonal Dynamics of Solar-Induced Chlorophyll Fluorescence, Vegetation Indices, and Gross Primary Productivity in the Boreal Forest

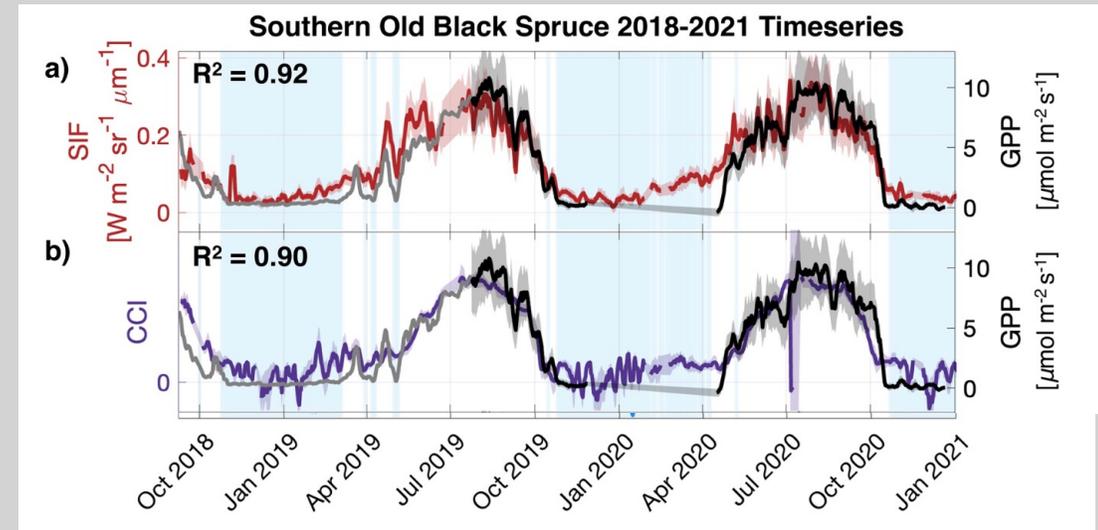
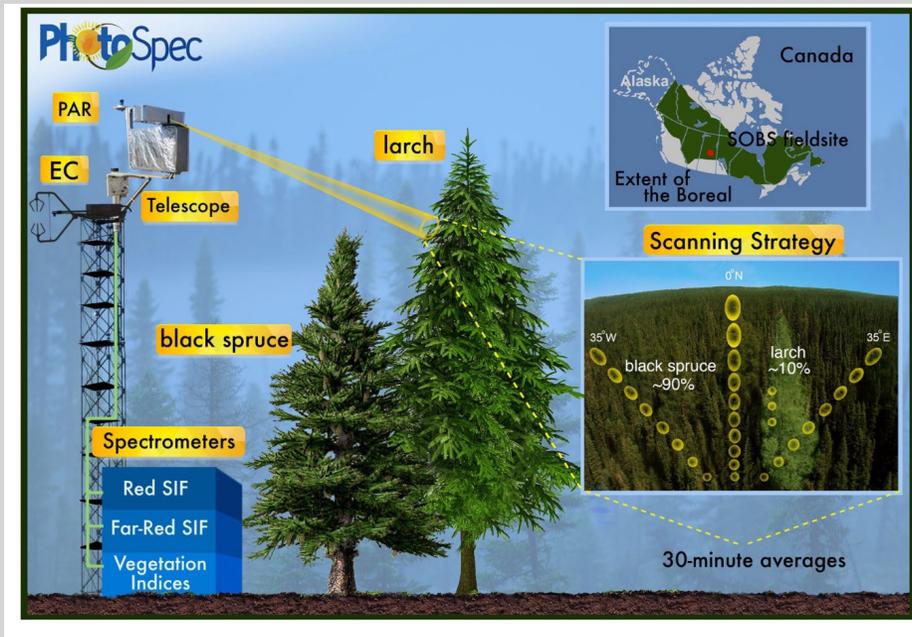
Key Points:

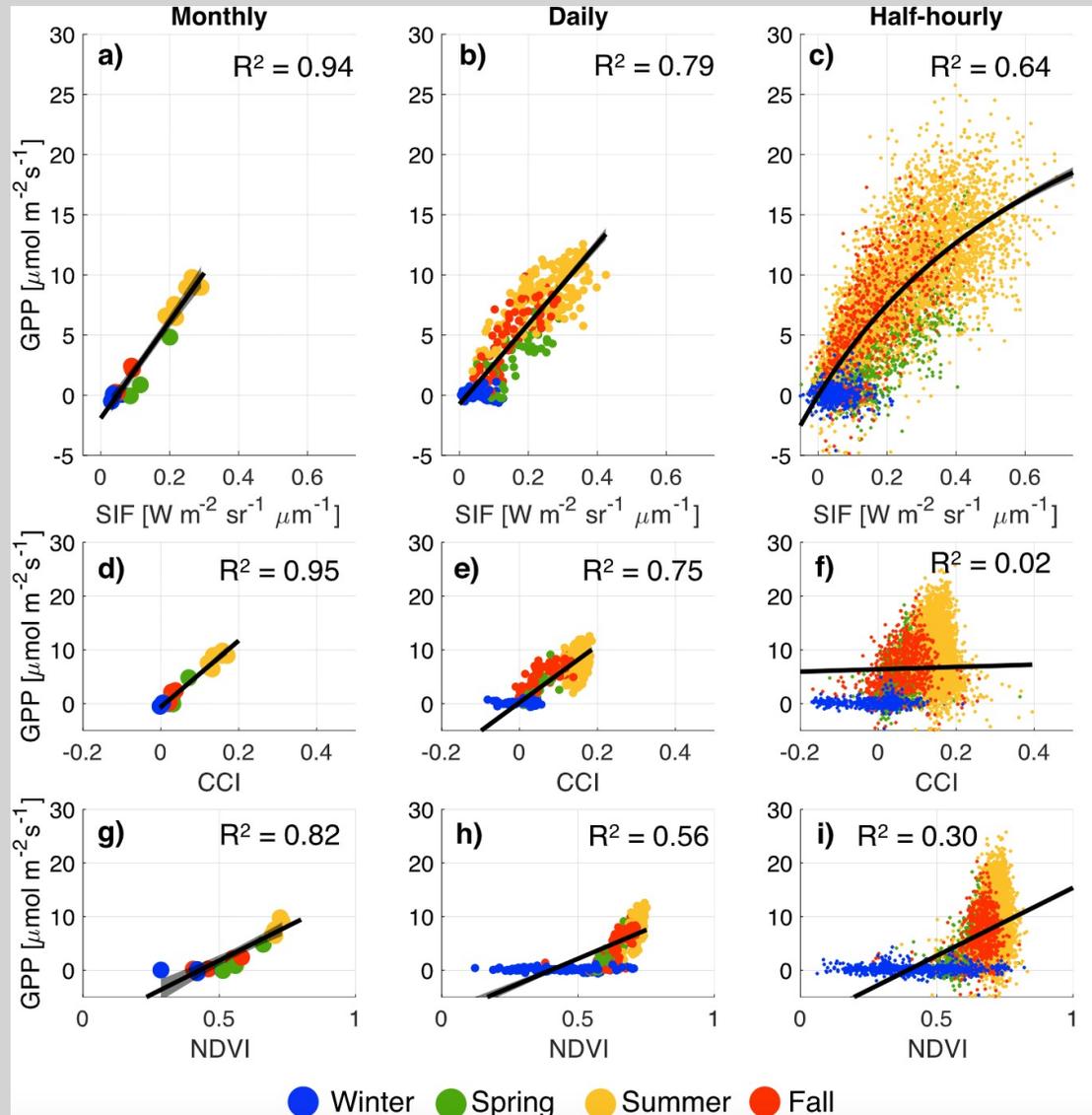
- Tower-based solar-induced chlorophyll fluorescence (SIF) closely tracks gross primary productivity (GPP) over two years in a mixed-species boreal forest
- Light saturation of photosynthesis drives non-linearity between SIF and GPP
- The SIF-GPP relationship is seasonally variant due to dynamics between LUE_F and LUE_P

Zoe Pierrat¹, Troy Magney², Nicholas C. Parazoo^{3,4}, Katja Grossmann⁵, David R. Bowling⁶, Ulli Seibt¹, Bruce Johnson⁷, Warren Helgason⁷, Alan Barr⁷, Jacob Bortnik¹, Alexander Norton³, Andrew Maguire³, Christian Frankenberg⁴, and Jochen Stutz¹

¹University of California Los Angeles, Los Angeles, CA, USA, ²University of California Davis, Davis, CA, USA, ³Jet Propulsion Laboratory, California Institute of Technology, Pasadena, CA, USA, ⁴California Institute of Technology, Pasadena, CA, USA, ⁵University of Heidelberg, Heidelberg, Germany, ⁶University of Utah, Salt Lake City, UT, USA, ⁷University of Saskatchewan, Saskatoon, SK, Canada

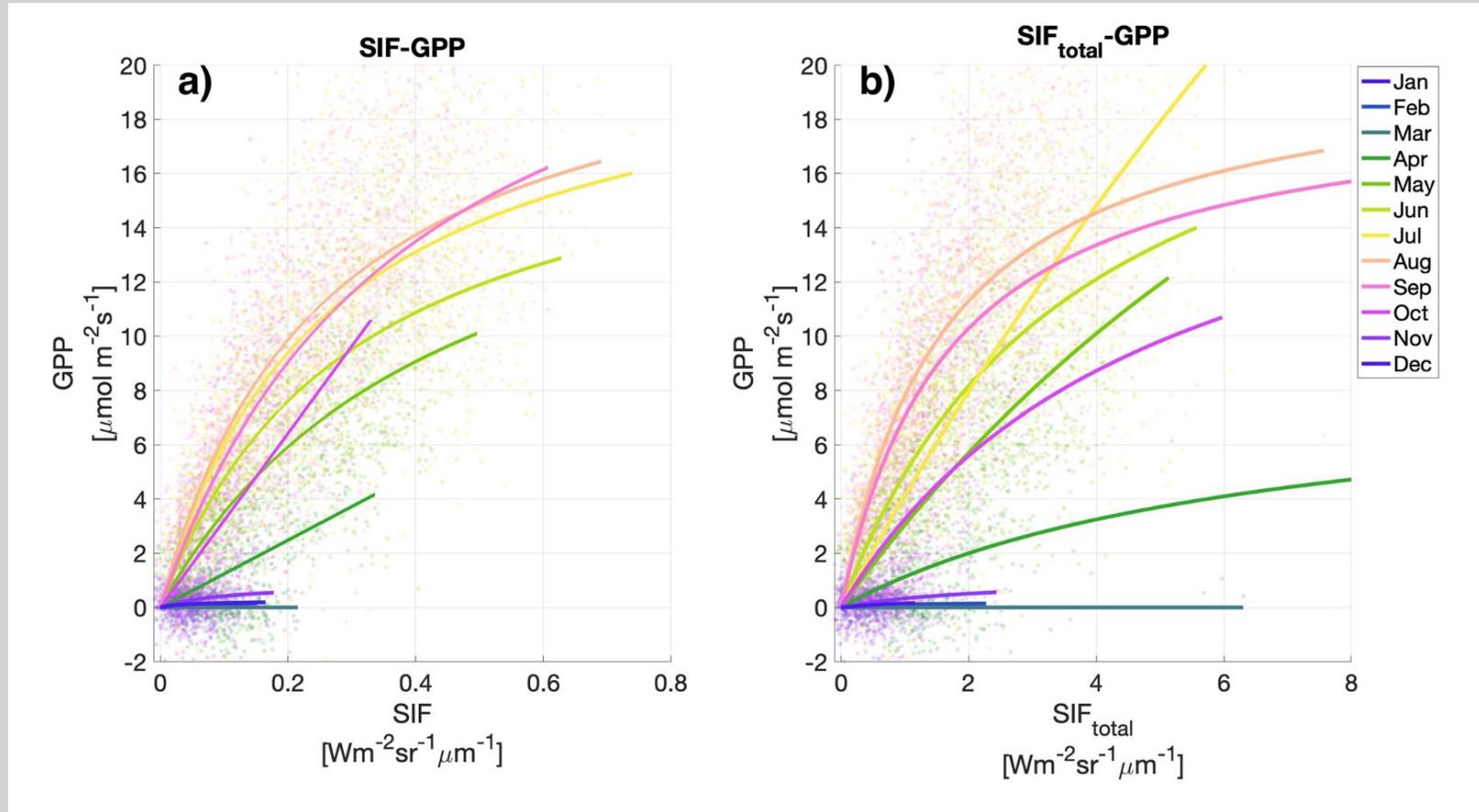
- Used high resolution tower spectral data to look at temporal dynamics of VIs and SIF at the Southern Old Black Spruce site in Saskatchewan





- Relationships between NDVI, CCI and SIF at Monthly, Daily and Half-hourly time scales
- Observed non-linearity in SIF at the half-hourly time scale due to GPP saturation at high light
- CCI and NDVI show no relationship at the half-hourly time scale with improvements in temporal aggregation

The SIF:GPP relationship is non linear at half-hourly intervals and the nature of the relationship changes on a monthly basis.



Challenges in comparing GPP derived from SIF and reflectance across spatial scales (tower vs. satellite)

Cheng, R., Magney, T. S., Orcutt, E. L., Pierrat, Z., Köhler, P., Bowling, D. R., ... & Frankenberg, C. (2022). Evaluating photosynthetic activity across Arctic-Boreal land cover types using solar-induced fluorescence. *Environmental Research Letters*, 17(11), 115009.

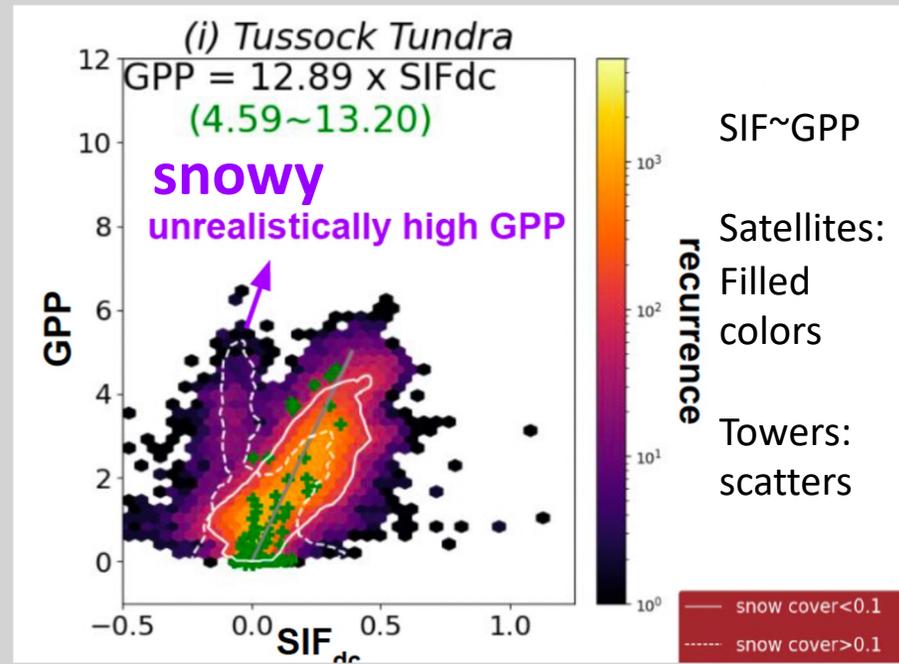
- subpixel heterogeneity (inconsistent land cover types across scales)

- snow

And

- Surface water
 - topography
 - extrapolation
 - ...
- Check out our paper

Name	30m	10km	IGBP	PI's definition
CA-HPC	Fen	Woodland	ENF	Woodland
CA-Obs	—	—	ENF	Evergreen Forest
CA-SMC	Woodland	Water	ENF	Evergreen Forest
CA-TVC	Herbaceous	Low Shrub	OSH	Low Shrub
DEJU	Evergreen Forest	Woodland	ENF	Evergreen Forest
US-An1	Sparsely Vegetated	Tussock Tundra	OSH	Sparsely Vegetated
US-An3	Tussock Tundra	Tussock Tundra	OSH	Tussock Tundra
US-Atq	Low Shrub	Sparsely Vegetated	WET	Tussock Tundra
US-BZB	Woodland	Deciduous Forest	WET	Fen
US-BZF	Low Shrub	Deciduous Forest	WET	Fen
US-BZS	Woodland	Deciduous Forest	ENF	Evergreen Forest
US-ICH	Low Shrub	Tussock Tundra	OSH	Low Shrub
US-ICs	Tussock Tundra	Tussock Tundra	WET	Fen
US-ICt	Tussock Tundra	Tussock Tundra	OSH	Tussock Tundra
US-Ivo	Herbaceous	Low Shrub	WET	Tussock Tundra
US-Prr	Woodland	Woodland	ENF	Evergreen Forest



Rui Cheng

Next Steps

Organize our discussions and findings on scaling in optical remote sensing for high latitudes leading to another group paper

We have been having monthly meetings, all are welcome, just join the working group to get on the mailing list

